

Article VADASE Reliability and Accuracy of Real-Time Displacement Estimation: Application to the Central Italy 2016 Earthquakes

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Abstract: The goal of this article is the illustration of the new functionalities of the VADASE (Variometric Approach for Displacements Analysis Stand-alone Engine) processing approach. VADASE was presented in previous works as an approach able to estimate in real time the velocities and displacements in a global reference frame (ITRF), using high-rate (1 Hz or more) carrier phase observations and broadcast products (orbits, clocks) collected by a stand-alone GNSS receiver, achieving a displacements accuracy within 1-2 cm (usually better) over intervals up to a few minutes. It has been well known since the very first implementation and testing of VADASE that the estimated displacements might be impacted by two different effects: spurious spikes in the velocities due to outliers (consequently, displacements, obtained through velocities integration, are severely corrupted) and trends in the displacements time series, mainly due to broadcast orbit and clock errors. Two strategies are herein introduced, respectively based on Leave-One-Out cross-validation (VADASE-LOO) for a receiver autonomous outlier detection, and on a network augmentation strategy to filter common trends out (A-VADASE); they are combined (first, VADASE-LOO; second, A-VADASE) for a complete solution. Moreover, starting from this VADASE improved solution, an additional strategy is proposed to estimate in real time the overall coseismic displacement occurring at each GNSS receiver. New VADASE advances are successfully applied to the GPS data collected during the recent three strong earthquakes that occurred in Central Italy on 24 August and 26 and 30 October 2016, and the results are herein presented and discussed. The VADASE real-time estimated coseismic displacements are compared to the static ones derived from the daily solutions obtained within the standard post-processing procedure by the Istituto Nazionale di Geofisica e Vulcanologia.

Keywords: GNSS seismology; variometric approach improvements; real-time coseismic displacements; Central Italy 2016 earthquakes

1. Introduction

In the last few years, a new approach to GNSS seismology, called VADASE, was developed [1,2]. VADASE is able to estimate in real time the velocities and displacements in a global reference frame



(ITRF), using high-rate (1 Hz or more) carrier phase observations and broadcast products (orbits, clocks) collected by a stand-alone GNSS receiver, achieving a displacements accuracy within 1–2 cm

(usually better) over intervals up to a few minutes. In this respect, the VADASE solution can be achieved in real time even on-board the GNSS receiver. Therefore, VADASE is able to supply in real time displacements and waveforms induced by an earthquake with an accuracy until now achievable only by seismometers or by two other well-established GNSS approaches: Precise Point Positioning (PPP) and Differential Positioning (DP).

Nevertheless, all these already available techniques to estimate coseismic displacements display some drawbacks. Seismometers are affected by saturation when they are close to strong earthquake epicenters. Moreover, both GNSS-based approaches have some restrictions: PPP achieves an accuracy of a few millimeters, but it requires additional precise products (orbits, clocks and Earth orientation parameters); DP guarantees the real-time solution only if all the GNSS receivers are continuously connected in a permanent station network and their data are processed in real time by a centralized analysis center according to a differential approach. Furthermore, in the case of strong earthquakes affecting the entire area covered by the GNSS permanent network, DP is not able to supply coseismic displacements and waveforms in the global reference frame, since no stable reference stations are available.

VADASE is able to overcome the above-mentioned limitations, since GNSS solutions do not clip even in the case of strong ground shakings, and neither additional products, nor reference stations are required. Anyway, since the very first implementation and testing of VADASE, it was noticed that the estimated displacements may be impacted by two different effects: spurious spikes in the velocities due to outliers, so that displacements, obtained through velocities integration, are severely corrupted; trends in the displacements time series, mainly due to broadcast orbit and clock errors.

Two strategies are herein introduced to solve these issues, respectively based on Leave-One-Out cross-validation [3] (VADASE-LOO) for a receiver autonomous outlier detection and on a network augmentation strategy to filter common trends out (A-VADASE); they are combined (first, VADASE-LOO; second, A-VADASE) for a complete solution (A-VADASE-LOO). Moreover, starting from this VADASE improved solution, an additional strategy is proposed to estimate in real time the overall coseismic displacement occurring at each GNSS receiver; this is based on the hypothesis of a constant mean level noise of the VADASE velocity estimates over a few minutes (just before, during and just after the earthquake) and on a robust estimation procedure.

An application of this VADASE improved solution and the real-time coseismic displacement estimations is herein presented for three relevant earthquakes that occurred in Central Italy in 2016 (M_w 6.0, 24 August 2016, 01:36:54 (UTC), M_w 5.9, 26 October 2016, 19:18:08 (UTC), M_w 6.5, 30 October 2016, 06:40:19 (UTC)). In Sections 2.1 and 2.2, VADASE-LOO and A-VADASE are described; in Section 2.3, their application to Central Italy earthquakes is discussed; in Section 3, the validation of the strategy for the real-time estimation of coseismic displacements with respect to the same earthquakes is given; finally, in Section 4, some conclusions are outlined.

2. VADASE Improved Solution

2.1. VADASE Leave-One-Out

The real-time VADASE solutions can be impacted by spurious oscillations in the estimated velocities, due to outliers in GNSS observations, resulting in false displacements [4]. A strategy to detect these outliers in real-time is defined on the basis of the Leave-One-Out Cross-Validation (LOOCV) approach; for technical details about this method, please refer to [3,5] As a matter of fact, standard techniques for outlier detection, as the well-known Baarda data snooping [6], are not able to supply statistical tests of suitable power in the case of low redundancy, which often may happen in the VADASE real-time epoch-by-epoch solution due to the limited number of satellites in view in the two considered consecutive epochs. On the contrary, LOOCV can overcome this problem, since one observation is tested for a possible

outlier at each time, but this is achieved at the cost of *n*-repeated least squares epoch-by-epoch solutions (*n* being the number of satellites in view in the two considered consecutive epochs).

Therefore, if *n* is the number of variometric equations, where the number of the sets of equations depends on the number of satellites common to the two epochs, the Leave-One-Out (LOO) method applied to the VADASE algorithm involves the repeated application of the algorithm using all the satellites except one, different in each iteration. The satellite left out is considered an outlier if the index w_n is out of the *t*-Student distribution at the 5% significance level (see the Appendix). LOOCV is however still feasible from the computational point of view (VADASE-LOO), since all the *n*-repeated least squares epoch-by-epoch solutions with up to 10–12 satellites take one millisecond on a standard PC processor (e.g., CPU Xeon, 3.30 GHz and 16 GB RAM); therefore, such a processing appears certainly feasible even in the case of a high observation rate (e.g., 50 Hz).

The benefit of VADASE-LOO to detect and eliminate the outliers was preliminary demonstrated through its application to the observations collected at M0SE IGS permanent station (Rome, Italy) over 67 days (3 February–9 April 2016) (Table 1). To compute the number of outliers, the 3D velocity variometric solutions obtained using VADASE and VADASE-LOO were considered; they were compared to a threshold value based on the noise (standard deviation σ) of the velocities estimated in an undisturbed setting; in detail, this noise was estimated over four days of solutions at the M0SE permanent station, and the threshold was chosen for each velocity component equal to 9 σ . A reduction of about 80% of the outliers present in the VADASE solutions was gained within the VADASE-LOO solutions.

Table 1. Number of outliers in the 3D velocity variometric solutions over 67 days (3 February–9 April2016) at the M0SE IGS permanent station.

Type of Solution	Number of Outliers					
Type of Solution	East	North	Up			
VADASE	140	188	126			
VADASE-LOO	12	48	33			

2.2. Augmented VADASE

The discrete integration of 3D estimated velocities obtained by VADASE-LOO to get displacements is often impacted by trends. A strong spatial correlation of these trends is clearly identified among close GNSS stations (at least within a radius of 100 km), due to the common errors in the satellite broadcast orbits and clocks [7]. In [8] the problem was solved using a spatial filtering technique, similar to the one proposed in [9]; anyway, this solution is rather unsuited for a real-time solution, since it involves a multi-epoch processing. For this reason, a new strategy is herein introduced, called the Augmented strategy (A-VADASE) in order to filter out these trends in real time. This approach is based on the computation of the spatial median of the displacements estimated by VADASE-LOO epoch-by-epoch, considering all the GNSS stations involved. The spatial median operator, much more robust compared to the mean, guarantees that in the case of ground motion due to an earthquake, generally impacting different stations in different ways and times, only the effect of the common trend is captured. Therefore, the spatial median, which can be computed in real time at each epoch, is subtracted from the displacement of each station at the same epoch, thus removing the common trend, while preserving the eventual local ground motion due to the earthquake. In order to guarantee the functionality of this augmentation approach, it is therefore supposed that all the VADASE-LOO epoch-by-epoch solutions individually estimated at each GNSS station are transferred in real time to a unique GNSS network managing center. It is worth noting that the transfer of the individual epoch-by-epoch solutions is much less invasive than the standard transfer of the epoch-by-epoch observations collected by all the GNSS stations, which is needed if the processing of the GNSS observations is concentrated in the GNSS network managing center and not distributed all over the network, as VADASE is able to allow.

2.3. Dataset and Results

A complex sequence of earthquakes occurred in Central Italy in 2016; they were the result of shallow normal faulting on NW-SE-oriented faults in the Central Apennines. The Apennines are a mountain range that runs from northern Sicily in the south to Liguria in the north. It is generated by the subduction and roll-back of the Adriatic plate. The Apennines are characterized by compressional tectonics and seismicity in the frontal accretionary wedge and extensional tectonics and seismicity to the west. The central Apennines are characterized by an extensional tectonics generating slow crustal deformations (at the few mm/year level) and are affected by repeated seismic sequences [10] with several significant earthquakes in recorded history [11].

The 30 October 2016 event was the largest one (M_w 6.5 Central Italy (Norcia) earthquake) and severely damaged the town of Norcia, in an ongoing sequence of damaging earthquakes, including the 24 August 2016 (M_w 6.0 Central Italy (Amatrice) earthquake), which caused approximately 300 fatalities and severely damaged the town of Amatrice, and the 26 October 2016 (M_w 5.9 Central Italy earthquake) without any fatalities.

Till now, the Italian Istituto Nazionale di Geofisica e Vulcanologia (INGV) recorded about 100,000 earthquakes in this sequence, five with $M_w \ge 5.0$, about 1200 with $3.0 \le M_w < 5.0$ and the remaining with magnitudes below 3.0 (seismic data archive http://iside.rm.ingv.it).

The largest events were recorded by a number of GPS stations belonging to the Rete Integrata Nazionale GPS (RING), SmartNet ITALPOS (Italian part of Hexagon Geosystems HxGN SmartNet) and Rete Regione Lazio (Figure 1), around the damaged area. The RINEX data at 1 Hz are available; regarding the navigation data, the daily broadcast ephemeris file for GPS, the free online distributed by CDDIS (Crustal Dynamics Data Information System)—NASA Archives of Space Geodesy Data were used. The availability of RINEX data at 1 Hz allowed us to compare the High-Rate (HR) to the static estimation of coseismic displacements.



Figure 1. GPS sites (blue squares); GPS velocities in the Eurasian fixed reference frame from [12] (red arrows); main faults from [13] (black lines: VBF: Vettore-Bove Fault; VF: Vettore Fault; GF: Gorzano Fault; PF: Paganica Fault); focal mechanisms of the three events show the extensional style (red and white beach balls). Velocities with respect to the Eurasian fixed frame [14] and error ellipses at the one sigma confidence level are shown.

The observations data were processed with the VADASE improved algorithm (VADASE-LOO and A-VADASE), estimating the 3D velocities (east, north and up components); for the 30 October earthquake, these velocities are displayed in Figure 2 for the 150-s interval across the mainshock, when the earthquake signatures were clearly evident. In Figures 2–6, the velocities, the displacements and the detrended displacements are represented, ordering the stations from the bottom to the top in dependence of their distance from the epicenter (the nearest station in the bottom and the farthest on the top) and shifting the velocities, the displacements and the detrended displacements by 0.1 mm/s, 0.1 mm each.



Figure 2. Estimated velocity by VADASE-LOO for the 150-s interval across the 30 October 2016 main shock (GPS time).

In order to depict the waveforms and to quantify the coseismic displacements, the 3D velocities were integrated. This integration is very sensitive to estimation biases, mainly due to residual clock and orbit errors, which accumulate over time and display their signature as a trend in the coseismic displacements. Examples of these trends for the 30 October earthquake and the 24 August earthquake are respectively shown in Figure 3 and, more evidently, in Figure 4.



Figure 3. Estimated displacements by VADASE-LOO for the 150-s interval across the 30 October 2016 main shock (GPS time).









Figure 4. Estimated displacements by VADASE-LOO for the 150-s interval across the 24 August 2016 main shock (GPS time).

A-VADASE strategy was applied to remove the spatial correlated trends; the detrended coseismic displacements, called A-VADASE-LOO, are displayed in Figures 5 and 6.

Figure 5. Estimated displacements after detrending by A-VADASE-LOO for the 150-s interval across the 30 October 2016 main shock (GPS time).

Figure 6. Estimated displacements after detrending by A-VADASE-LOO for the 150-s interval across the 24 August 2016 main shock (GPS time).

A-VADASE-LOO solutions were compared to the results obtained, with the same dataset, using Point Positioning Processing (PPP) strategy. The Kinematic PPP is free and online through a well-known and reliable online service, Automatic Precise Positioning Service (APPS), which applies the most advanced GPS positioning technology from NASA's Jet Propulsion Laboratory (JPL) to

estimate the position of GPS receivers (http://apps.gdgps.net/). The observation files provided to the PPP services are relative to two hours: one hour before and one hour after the earthquake main shock beginning at the nearest station.

For each station, the two solutions (A-VADASE-LOO vs PPP) were aligned (i.e., their difference was set to zero) at a conventional initial epoch (starting epoch of the station nearest to the epicenter) and compared within a time interval of ten seconds, corresponding to the significant shaking duration detected by GNSS. The retrieved positions were differenced at the corresponding epochs, and the agreement between the solutions was evaluated by the RMSE of the differences. For the sake of brevity, only the graphic results related to the two GNSS stations nearest the epicenter are presented for the 24 August and 30 October earthquakes (Figures 7 and 8); on the other hand, the tables of the differences for all the GNSS stations and for all the earthquakes are presented (Tables 2–4).

The comparisons between A-VADASE-LOO and PPP for all components (east, north and up) and for all earthquakes demonstrated the reliability and the high accuracy of the VADASE solutions; the differences between the two approaches, in terms of RMSE on the three components, were (in the average) in the order of 0.5–1 cm in the horizontal components east-north and in the order of 1–1.5 cm in height (Tables 2–4).

(b) AMAT

Figure 7. A-VADASE-LOO vs. PPP in the 30-s interval across the 24 August 2016 main shock (GPS time).

Figure 8. A-VADASE-LOO vs. PPP in the 30-s interval across the 30 October 2016 main shock (GPS time).

Table 2. Comparison between A-VADASE-LOO and PPP solutions: 24 August 2016 earthquake.

Station	RMSE (cm)						
Station	East	North	Up				
NORC	0.7	0.9	1.1				
AMAT	0.6	1.3	2.3				
MTER	0.7	1.4	1.4				
MTTO	0.5	1.8	2.0				
CESI	0.5	2.6	1.5				
GNAL	0.4	0.7	0.3				
RIET	0.5	0.6	0.9				

Table 3. Comparison between A-VADASE-LOO and PPP solutions: 26 October 2016 earthquake.

Station	RMSE (cm)					
Station	East	North	Up			
GUMA	0.5	1.5	1.2			
FOL1	1.3	0.6	1.1			
MACE	0.4	0.5	1.2			
FRMO	1.5	1.1	1.3			
TOD3	1.2	1.7	1.0			
GRAM	1.0	0.8	1.7			
PSAN	0.8	1.2	0.8			

Station	RMSE (cm)					
Station	East	North	Up			
ARQT	0.7	1.3	0.4			
FOL1	0.5	0.6	0.6			
MTER	0.4	0.2	0.5			
MTTO	0.5	0.2	1.2			
GNAL	0.4	0.2	2.4			
TERI	0.6	0.5	0.8			
RIET	0.4	0.7	0.6			
CONI	0.5	0.3	0.7			
TOD3	0.9	0.4	0.8			
FRMO	0.5	0.3	0.5			
ROPI	0.5	0.3	0.6			
GRAM	0.9	0.7	1.9			
BARS2	0.5	0.5	1.0			
CAOC	0.4	0.3	0.7			
PSAN	0.4	0.3	1.4			

Table 4. Comparison between A-VADASE-LOO and PPP solutions: 30 October 2016 earthquake.

3. VADASE Real-Time Coseismic Displacements

It is well known that the knowledge of the coseismic displacements field is the key information for seismic inversion and the studies about the fault source mechanism. Whereas, the off-line estimation of the coseismic displacement field has been repeatedly proven successful on the basis of InSAR and GNSS dense networks (some relevant examples are described in [15–17] and in [18–20]), this estimation in real time can only be based on GNSS permanent networks, and it is still a challenge at the international level, where the problem is faced with the primary goal of supplying timely information for tsunami early warning [21]. This is the why, here, a new real-time strategy to coseismic displacement estimation based on the VADASE solution is proposed. The results coming from this strategy are compared to a second solution obtained by the PPP technique and to the standard off-line (also called static) solution.

3.1. VADASE Solution

The main idea underlying VADASE real-time coseismic displacement estimation is to define the significant shaking duration detectable by GNSS on the basis of the mean noise level of the VADASE velocity solution, which has been recognized to be constant with a Gaussian distribution before and after the earthquake shaking, and to estimate the displacement occurring across the shaking interval.

In detail, at first, on the basis of a chosen time moving window (here, e.g., 30 s long), it is possible to compute the mean noise level (standard deviation) of the horizontal velocity component just before the beginning of the earthquake shaking, that is in an undisturbed situation (reference standard deviation σ_0); only the horizontal velocity component is considered, since it is less noisy with respect to the 3D velocity and therefore more sensitive to the shaking. Then, moving this window epoch-by-epoch, the standard deviation (at epoch *i*, σ_i) of the horizontal velocity is computed across the earthquake shaking, which leads to an increase of the standard deviation itself. The running standard deviation at each epoch σ_i is tested against the reference standard deviation σ_0 , in order to detect when they again become equal from the statistical point of view, so that significant shaking is over; to this aim, the standard statistical test for variance comparison for independent samples of equal size is used, under the hypothesis (generally well confirmed) that the noise of the horizontal velocity component is Gaussian in an undisturbed situation:

$$F_{sp (N-1),(N-1)} = \sigma_i^2 / \sigma_0^2 \tag{1}$$

where N is the size (here 30, with a sampling rate of 1 s) of both samples. Note that the latency to define the starting and ending epochs of the significant shaking is at least equal to the length of the moving window. Moreover, to make the real-time coseismic displacement estimation procedure more

reliable avoiding the solution being dependent on the spurious oscillation of the F_{sp} statistic, it was decided to define the starting epoch of the significant shaking only when F_{sp} exceeded the threshold of the Fisher value at a certain significance level (here chosen equal to 1%) for at least five consecutive epochs at an observation rate of 1 Hz and, correspondingly, the end epoch only when F_{sp} was below the same threshold again for at least five consecutive epochs. Note that in the case that the observation rate is higher, the number of consecutive epochs to be considered to define the starting and the ending epochs must proportionally increase.

After having determined the duration of the significant shaking, the coseismic displacement was estimated as the difference between the medians of the displacements within the moving windows respectively corresponding to the ending and the starting epochs (e.g., in Figures 9 and 10).

Figure 9. VADASE real-time coseismic displacement estimation at AMAT (Amatrice) for the 24 August 2016 main shock.

Figure 10. VADASE real-time coseismic displacement estimation at ARQT (Arquata del Tronto) for the 30 October 2016 main shock.

3.2. PPP Solution

The same strategy defined to estimate coseismic displacements on the basis of VADASE solutions was applied to the solutions derived through PPP by using Automatic Precise Positioning Server PPP online tools, based on GIPSY 6.4 (APP-PPP, http://apps.gdgps.net/). However, in this case, a much longer data interval (in our case, 2 h before the earthquake plus 150 s) was necessary with respect to the few minutes used for the VADASE solution, in order to guarantee the fixing of the initial ambiguities [22]. We acknowledge that, in principle, this is not a severe drawback, provided continuous data are collected, as it is standard if a GNSS permanent network is available. Note that PPP (here used in post-processing) is also able to estimate real-time solutions, provided precise orbit and clock products are available in real time, as well, as those supplied by the International GNSS Service Real-Time Service (http://www.igs.org/rts) or other similar services.

3.3. INGV Static Solution

The coseismic displacements were obtained from the GPS data acquired by the very large GNSS network (more than 1000 permanent stations, mostly at a 30-s sampling rate, only few at 1 s) routinely processed daily at the Istituto Nazionale di Geofisica e Vulcanologia (INGV) [23,24]. The available GPS data, in the form of 24-h 30-s sampling rate RINEX files, were processed by three different analysis groups, using different software (BERNESE, http://www.bernese.unibe.ch; GAMIT, http://www.gpsg.mit.edu/~simon/gtgk; and GIPSY, http://gipsy.jpl.nasa.gov/orms/goa). The three processing approaches are well described in [12], usually devoted to estimating velocity and strain rate fields. The static coseismic displacements are computed from three distinct time series of stations located around the epicenters from the linear model:

$$x_{i}(t) = x_{i}(t_{0}) + r_{i} \cdot (t - t_{0}) + \alpha_{i} \cdot \sin(\omega(t - t_{0}) + \varphi_{i}) + \Delta x_{i} \cdot H(t_{eq})$$
(2)

where $x_i(t)$ are the Cartesian coordinates at epoch t of each site (i = 1, 2, 3), $x_i(t_0)$ are the coordinates at reference epoch t_0 , r_i are the rates, α and φ are the amplitude and phase of periodical signals (mostly annual) and H is the Heaviside step function, used to estimate the coordinate offsets (Δx_i) at a given epoch t_{eq} .

The three sets of independent coseismic displacements were estimated by excluding the Day of the Earthquake (DOE) and limiting the time series to the 15 days before DOE and only to the three days after DOE, to minimize the effects of early postseismic displacements, commonly observed in a wide range of seismic events causing deformations up to several centimeters, depending on the magnitude and the driving mechanism. The three independent coseismic displacements estimates were then combined to obtain a final field of validated displacements, following the procedure described in [25] and first applied in [26]. The combination allows one to obtain a final revised solution, with efficient outlier detection obtained after cross-checking independent solutions and realistic estimates of the displacement uncertainties.

3.4. Results

The coseismic displacements estimated in a real-time scenario (that is in post-processing in a retrospective analysis, but using only the information that would have been available in real time) from A-VADASE-LOO and in post-processing from PPP using the described original procedure, as well as from routine INGV daily solution are reported in Tables 5–7. Note that the combined INGV coseismic displacements after the 24 August, 26 October and 30 October 2016 earthquakes (INGV Working Group "GPS Geodesy (GPS data and data analysis center)", 2016) are fully available at http://ring.gm.ingv.it [27–29].

The differences between the estimated coseismic displacements according to the three different approaches (VADASE, PPP, static) and the main statistical indices of these differences (mean, Standard Deviation (St.Dev.) and Root Mean Square Error (RMSE)) are summarized in Tables 8–10.

PSAN

TOD3

-0.1

_

0.1

_

-0.2

_

It is important to highlight that the agreement between the two potentially real-time solutions (VADASE and PPP) was at a level better than 1 cm for the horizontal components and around 2 cm in height, which would not be satisfying for small coseismic displacements, but it is certainly appropriate for larger displacements, as for ARQT station in the 30 October 2016 earthquake, where the agreement was even better. Moreover, the agreement of the VADASE real-time scenario solution with the INGV static solution is better than for the PPP solution, at a level of 0.5–1 cm in the horizontal components and of 1–1.5 cm in height.

Station	INGV (cm)			PPP (cm)			A-VADASE-LOO (cm)		
Station	East	North	Up	East	North	Up	East	North	Up
AMAT	-1.1	2.2	-1.5	-0.5	2.5	4.5	-0.8	2.5	-2.6
CESI	-0.0	-0.2	-0.2	0.6	-0.8	2.2	-0.0	-0.4	-1.2
GNAL	0.6	0.0	-0.1	_	_	_	0.1	0.2	3.3
MTER	-0.2	-0.9	0.1	-0.5	0.4	-0.5	0.0	-0.6	0.2
MTTO	-0.3	-0.5	-0.2	0.1	0.5	-0.7	0.1	-0.3	0.3
NRCI	-2.2	-1.1	0.5	-1.6	-2.6	1.6	-2.8	-3.0	-0.7
RIET	-0.3	-0.4	0.0	-1.0	-1.4	-4.4	0.6	-0.6	0.8

Table 5. Coseismic displacements: 24 August 2016 earthquake.

Station	Ι	NGV (cm	ı)		PPP (cm)			A-VADASE-LOO (cm)		
Station	East	North	Up	East	North	Up	East	North	Up	
FOL1	-0.5	0.2	0.3	0.3	0.1	1.2	-0.1	-0.5	0.0	
FRMO	0.2	0.3	-0.4	-0.7	1.3	-1.4	-0.5	1.6	-0.7	
GRAM	0.1	0.1	-0.2	1.0	1.6	-0.1	-0.5	0.1	-0.6	
GUMA	1.5	0.9	-0.5	0.5	-0.1	0.9	1.2	0.1	-0.5	
MACE	0.1	0.3	-0.3	-0.0	0.4	2.1	-0.7	1.4	1.6	

Table 6. Coseismic displacements: 26 October 2016 earthquake.

Table 7. Coseismic disp	lacements: 30 October	2016 earthquake.
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-0.2

-0.8

-2.3

-1.5

1.0

1.3

-0.8

0.7

0.5

-2.1

0.6

-0.5

Station]	NGV (cn	n)		PPP (cm)			A-VADASE-LOO (cm)		
0	East	North	Up	East	North	Up	East	North	Up	
ARQT	-4.4	5.3	-44.7	-3.9	5.6	-43.4	-3.2	5.0	-43.4	
BARS	-0.0	-0.0	0.8	-0.1	-0.5	0.8	0.2	-0.4	1.0	
CAOC	0.0	-0.0	0.4	0.3	-0.2	0.4	0.3	-0.0	-1.3	
CONI	0.1	-0.2	0.7	0.3	-0.5	1.0	-0.3	0.2	1.0	
FOL1	-1.7	0.0	-0.4	-1.1	0.4	2.4	0.1	1.1	2.1	
FRMO	0.8	0.7	0.7	1.1	-0.2	5.4	1.5	0.1	0.7	
GNAL	0.9	-0.3	0.5	1.3	-0.2	0.7	1.8	-0.4	0.9	
GRAM	1.2	0.4	0.4	0.5	0.1	-2.5	1.9	2.2	0.9	
MTER	-0.1	-1.0	0.3	-0.0	-1.1	0.6	-0.0	-1.0	0.9	
MTTO	-1.0	-1.2	0.1	-0.8	-1.6	1.1	-0.1	-1.6	2.6	
PSAN	0.3	-0.1	-0.0	0.1	-0.4	1.8	-0.2	0.5	0.9	
RIET	-0.8	-1.1	0.1	-0.4	-1.3	0.7	0.3	-1.0	-0.1	
ROPI	-0.1	-0.2	0.3	-0.1	0.2	0.9	0.3	0.3	-0.0	
TERI	-1.5	-0.8	0.1	-1.0	-0.4	0.3	-0.4	0.2	-0.8	
TOD3	_	_	_	-0.5	-0.3	3.0	-0.1	-1.1	-1.9	

Mean

St.Dev.

RMSE

0.5

0.5

0.8

0.8

1.5

15

			1		0		1	
A-VA	DASE-LOO	O-INGV (cm)	A-VA	DASE-LO	O-PPP (cm)	PP	P-INGV ((cm)
East	North	Up	East	North	Up	East	North	Up
0.1	-0.2	0.2	0.0	-0.2	0.5	0.2	-0.1	-0.8

0.6

0.7

2.8

2.8

0.5

0.5

1.0

1.0

Table 8. Differences of coseismic displacements: 24 August 2016 earthquake.

Table 9. Differences of coseismic displacements: 26 October 2016 earthquake.

0.9

0.9

	A-VADASE-LOO-INGV (cm)			A-VA	DASE-LO	OO-PPP (cm)	PPP-INGV (cm)		
	East	North	Up	East	North	Up	East	North	Up
Mean	-0.1	0.0	0.3	0.1	0.1	-0.1	0.1	0.2	0.3
St.Dev.	0.7	0.9	0.8	1.0	1.0	1.3	0.8	0.8	1.5
RMSE	0.7	0.9	0.9	1.0	1.0	1.3	0.8	0.8	1.5

Table 10. Differences of coseismic displacements: 30 October 2016 earthquake.

	A-VADASE-LOO-INGV (cm)			A-VA	DASE-LC	OO-PPP (cm)	PPP-INGV (cm)		
	East	North	Up	East	North	Up	East	North	Up
Mean	0.6	0.3	0.4	0.4	0.3	-0.6	0.2	-0.1	0.7
St.Dev.	0.6	0.6	1.1	0.5	0.7	2.0	0.3	0.4	1.6
RMSE	0.9	0.7	1.2	0.7	0.7	2.1	0.4	0.4	1.8

4. Conclusions and Prospects

VADASE (Variometric Approach for Displacement Analysis Standalone Engine) is an approach to estimate in real-time the 3D displacements of a single GNSS receiver, just using the time differences of the high-rate (i.e., 1 Hz or more) carrier phase observations, together with the broadcast orbits and clocks.

This paper proposed two improvements to overcome two well-known problems of the VADASE solution, that is spurious oscillations in the velocity estimates due to outliers in GNSS observations and trends in the derived displacements due to errors in broadcast orbits and clocks. With regard to the first problem, a strategy (VADASE-LOO) to detect outliers in the observations during the real-time estimation was defined, on the basis of the Leave-One-Out Cross-Validation (LOOCV). With regards to the second problem, at first, a strong spatial correlation of these trends among close GNSS stations was clearly identified, so that an augmentation strategy (A-VADASE) was introduced to filter out them on the basis of a spatial median.

The two new strategies were applied to data collected during the recent three strong earthquakes that occurred in Central Italy on 24 August, 26 and 30 October 2016, and it was demonstrated that the combination of VADASE-LOO and A-VADASE has a positive impact, leading to the enhanced A-VADASE-LOO solution. The comparison with the well-known PPP solution, here computed in post-processing using the best available products (IGS final orbits and clocks), showed an agreement between the two approaches in terms of RMSE at a level of 0.5–1 cm in the horizontal components east-north and at the level of 1–1.5 cm in height.

Moreover, an original strategy for real-time estimation of coseismic displacements, based on the A-VADASE-LOO solution, was also introduced, based on the well-confirmed hypothesis of constant and Gaussian noise of the VADASE solution just before and after a ground shaking event due to an earthquake.

Again, this original strategy was applied to the same above-mentioned data, and a quite good agreement was shown, both with the INGV static solutions, at a level of 0.5–1 cm in the horizontal

-0.82.3

2.4

components and of 1–1.5 cm in height, and with the PPP post-processed solutions, at a level better than 1 cm for the horizontal components and around 2 cm in height. These levels of agreement, quite similar to those between the INGV static and the PPP post-processed solutions, confirmed that the proposed real-time strategy was able to provide coseismic displacements at state-of-the-art accuracy, and this is compliant with the goals of the GNSS Augmentation for Tsunami Early Warning (GATEW) initiative promoted by the Global Geodetic Observing System (GGOS) Geohazard Focus Area.

As regards future prospects, three main issues have to be considered: at first, A-VADASE-LOO solution needs to undergo further assessments, applying and comparing it both to the standard VADASE solution and to other independent solutions; moreover, further checks are needed in order to define the proper length of the moving windows in order to keep the latency as short as possible; finally, the real-time coseismic estimation procedure has to be additionally checked also in the case of higher observation rates, in order to better assess the criteria to select the minimum number of consecutive epochs to define the starting and the ending of the significant shaking epoch.

5. Patents

Patent for VADASE (System for measuring coseismic movements or vibrations of structures based on the Global Navigation Satellite System (GNSS) and/or pseudolites): EPApplication EP2580607A1 (https://patents.google.com/patent/EP2580607A1/en?oq=en).

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Abbreviations

The following abbreviations are used in this manuscript:

CDDIS	Crustal Dynamics Data Information System
EOP	Earth Orientation Parameters
GGOS	Global Geodetic Observing System
GNSS	Global Navigation Satellite System
GPS	Global Positioning System
HR	High Rate
INGV	Istituto Nazionale di Geofisica e Vulcanologia
ITRF	International Terrestrial Reference Frame
LOOCV	Leave-One-Out Cross-Validation
PPP	Precise Point Positioning
RINEX	Receiver Independent Exchange Format
RING	Rete Integrata Nazionale GPS
RMSE	Root Mean Square Error
UTC	Universal Time Coordinated
VADASE	Variometric Approach for Displacement Analysis Stand-alone Engine

Appendix A

Here, some technical details are given on the application of the Leave-One-Out (LOO) strategy to the VADASE algorithm for the identification and removal of possible outliers in the phase observations; for additional information about LOO, please refer to [3,5].

If *n* satellites common to two consecutive epochs are available, so that *n* variometric equations can be written, the LOO method requires *n* different least squares solutions for these consecutive epochs, each of them based on (n - 1) variometric equations leaving out one satellite, different in each solution.

Therefore, to decide if the observations vector Y_0 includes an outlier, that means that one observation does not follow the standard (linearized) functional model:

$$\mathbf{y} = \mathbf{A}\mathbf{x} + \mathbf{b} \tag{A1}$$

where y is the observables vector (n, in our case), A is the design matrix, x is the vector of the parameters (just four for each couple of epochs in the VADASE solution) and b is the known term; one observation is removed at each time. The functional model (A1) is rewritten as follows:

$$\begin{cases} y_{n-1} = A_{n-1}x_{n-1} + b_{n-1} \\ y_n = Rx + b_n \end{cases}$$
(A2)

where y_n is the last observable, R is the last row of the matrix A and b_n is the last known term; without losing generality, since the equations can change their order in A1, the possible outlier is supposed to impact just the last equation, so that the corresponding observation Y_{0n} has to be checked and is excluded from the estimation process.

If only the first n - 1 observations are used to estimate the parameters x, the \hat{x}_{n-1} vector is obtained, which is not affected by the possible outlier:

$$\hat{\mathbf{x}}_{n-1} = (\mathbf{A}_{n-1}^{T} \mathbf{W}_{n-1} \mathbf{A}_{n-1})^{-1} \mathbf{A}_{n-1}^{T} \mathbf{W}_{n-1} (\mathbf{Y}_{0_{n-1}} - \mathbf{b}_{n-1}) \tag{A3}$$

where W_{n-1} is the weight matrix without the last row and column.

Under the hypothesis of the Gaussian observations, for the excluded n-th observation, the statistical \hat{w}_n is computed, defined as:

$$\hat{w}_n = \frac{\hat{v}_{\mathbf{0}_n}}{\hat{\sigma}_{v_{\mathbf{0}_n}}} \tag{A4}$$

where the subscript *n* refer to the excluded observation and where:

$$\hat{v}_{0_n} = Y_{0n} - \hat{y}_n \tag{A5}$$

On the other hand, the $\hat{\sigma}_{\nu_{0_n}}$ is:

$$\hat{\sigma}_{\nu_{0_n}}^2 = \hat{\sigma}_{Y_{0_n}}^2 + \hat{\sigma}_{\hat{y}_n}^2 \tag{A6}$$

where:

$$\begin{cases} \hat{\sigma}_{Y_{0n}}^2 = \frac{\hat{\sigma}_{0n-1}^2}{\mathbf{w}_{\mathbf{n},\mathbf{n}}} \\ \hat{\sigma}_{\hat{g}_n}^2 = \mathbf{R} \mathbf{C}_{\hat{\mathbf{x}}_{\mathbf{n}-1},\hat{\mathbf{x}}_{\mathbf{n}-1}} \mathbf{R}^{\mathrm{T}} \end{cases}$$
(A7)

where $w_{n,n}$ is the weight of the excluded observation.

Since the σ_0^2 is unknown, the estimated $\hat{\sigma}_{0_{n-1}}^2$ is used in (A7):

$$\hat{\sigma}_{0_{n-1}}^2 = \frac{\hat{\nu}_{0_{n-1}}^T W_{n-1} \hat{\nu}_{0_{n-1}}}{(n-1) - 4}$$
(A8)

and:

$$\mathbf{C}_{\hat{\mathbf{x}}_{n-1},\hat{\mathbf{x}}_{n-1}} = \hat{\sigma}_{0_{n-1}}^2 (\mathbf{A}_{n-1}^T \mathbf{W}_{n-1} \mathbf{A}_{n-1})^{-1}$$
(A9)

$$\hat{\sigma}_{0_{n-1}}^2 = \hat{\sigma}_{0_{n-1}}^{*2} \frac{n-4}{(n-1)-4} \tag{A10}$$

Under the hypothesis H_0 that the excluded observation does not contain any outlier, the index \hat{w}_n follows the *t*-Student distribution ($\hat{w}_n \sim t_v$), where *v* are the degrees of freedom, in this case equal to v = (n-1) - 4). Therefore, choosing a significance level α (1% or 5%), the threshold $t_{v,\frac{\alpha}{2}}$ to accept or reject H_0 is determined, so that it is possible to conclude that the excluded observation does not contain an outlier if \hat{w}_n is within the range $[-t_{v,\frac{\alpha}{2}}, t_{v,\frac{\alpha}{2}}]$.

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